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## Retrieval of Land Surface Parameters using Passive Microwave Remote Sensing

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**RETRIEVAL OF LAND  
SURFACE PARAMETERS USING  
PASSIVE MICROWAVE  
REMOTE SENSING**

Richard A.M. de Jeu

**Cover:** Earth rising above the Moon's horizon. Photo was taken during the famous Apollo-11 mission where astronaut Neal Armstrong stepped onto the lunar surface for the first time.  
Photo Credit: NASA

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The full text of this thesis and additional background information are available on the internet at <http://www.geo.vu.nl/~geomil>

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VRIJE UNIVERSITEIT

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Microwave Remote Sensing**

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ter verkrijging van de graad van doctor aan  
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geboren te Alkemade

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